

Keynote address: Centre for Education and Learning, Leiden-Delft-Erasmus Universities, 7th Dec. 2022



"LA culture" comes from trust

Trust comes from respectful conversations in 4 different 'rooms'...

Boardroom

Staff room

Classroom

Server room

"Learning Analytics"



Beyond data dashboards

An LA dashboard ≠ agency

→ LA Literacy

Simply graphing data ≠ sensemaking

→ Data Storytelling

Time-consuming LA ≠ educator benefit

→ Automated Feedback



"Learning Analytics"

...a meaningless term to most academics

We now use language around differentiation, belonging and feedback

Automated Personalised Feedback

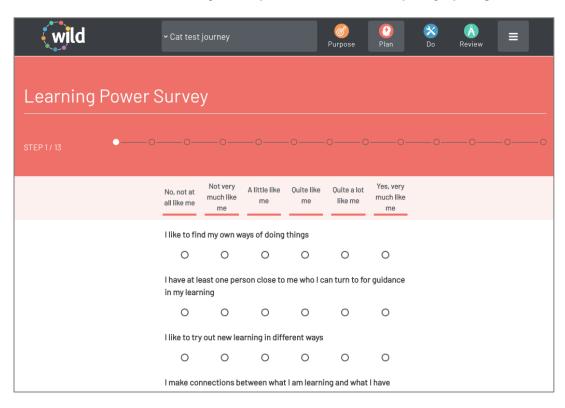


Automated Personalised Feedback – examples

Dispositional Learning Analytics:

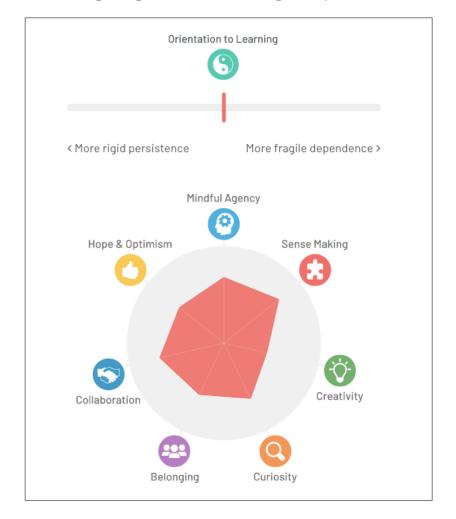
Personalised feedback with a Learning Power profile

Validated survey as part of an enquiry project





A language for learning dispositions

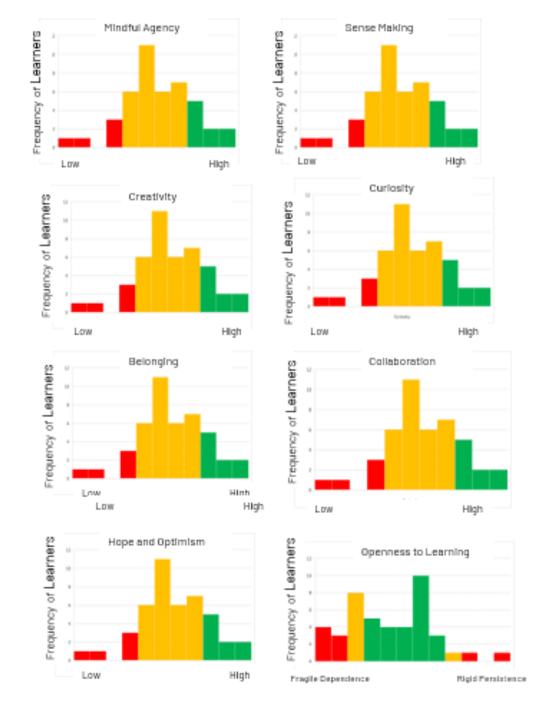


Deakin Crick, R., Huang, S., Ahmed Shafi, A. and Goldspink, C. (2015). Developing Resilient Agency in Learning: The Internal Structure of Learning Power. *British Journal of Educational Studies*: 62, (2), 121-160. http://dx.doi.org/10.1080/00071005.2015.1006574

Cohort analytics: overview for subject coordinator

Distribution for each dimension across the cohort

A heads-up on how the cohort sees themselves...



Amplifying teacher presence via personalised feedback using OnTask

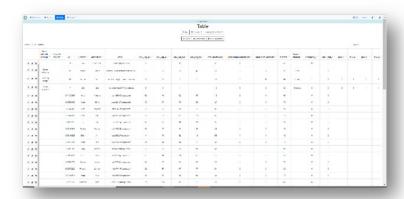
Repository of student data (e.g. online activity; attendance; survey responses...)

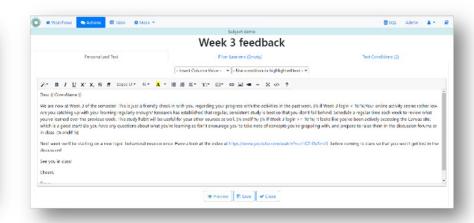


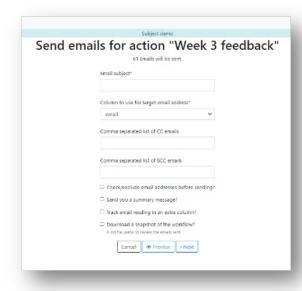
Message editor to differentiate feedback based on the student data



Delivery system to preview and send email feedback



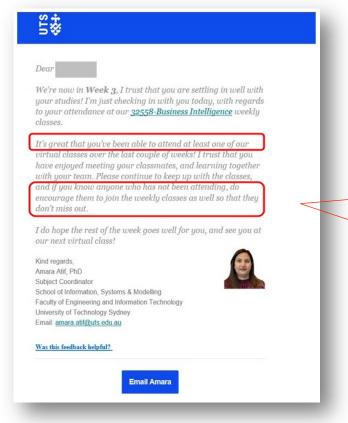




Lim, L.-A., Atif, A., & Farmer, I. (2022). 'Made good connections': Amplifying teacher presence and belonging at scale through learning design and personalised feedback. *Proceedings ASCILITE 2022: 39th International Conference on Innovation, Practice and Research in the Use of Educational Technologies in Tertiary Education,* Sydney, 4-7 Dec. 2022: e22055, pp.1-10. https://doi.org/10.14742/apubs.2022.55

Activity-Based Conditional (ABC) Messaging:

Tailored feedback at scale



(a) Feedback message to students who attended at least 1 class

classes weeks 1-3

(b) Feedback message to students who missed all

I noticed you haven't attended week 1, 2, and 3 classes. Your attendance at weekly classes is an important way to connect and learn with your class, as well as to ask any questions that you may have about the subject. I am concerned that if you continue to miss our classes, you may be missing out on opportunities to learn together with your class. For example, each week we have related in-class activities which students do in groups and is an opportunity to interact with your peers and polish soft skills such as communication, collaboration,

active-listening, problem-solving, critical thinking, empathy.

It's great that you've been able to attend at least one of our virtual classes over the last couple of weeks! I trust that you have enjoyed meeting your classmates, and learning together

with your team. Please continue to keep up with the classes,

encourage them to join the weekly classes as well so that they

and if you know anyone who has not been attending, do

don't miss out.

Lim, L.-A., Atif, A., & Farmer, I. (2022). 'Made good connections': Amplifying teacher presence and belonging at scale through learning design and personalised feedback. Proceedings ASCILITE 2022: 39th International Conference on Innovation, Practice and Research in the Use of Educational Technologies in Tertiary Education, Sydney, 4-7 Dec. 2022; e22055, pp.1-10. https://doi.org/10.14742/apubs.2022.55

Writing Analytics: 24/7 personalised feedback on drafts

Genre: research abstract

Analytical Report Feedback Resources Show move details **Background / Context move** Purpose of the Paper / Present Research move Research Problem / Issues / Gap in the literature move Results / Findings move It is now widely accepted that timely, actionable feedback is essential for effective learning. In response to this, data science is now impacting the education sector, with a growing number of commercial products and research prototypes providing "learning dashboards", aiming to provide real time progress indicators. From a human-centred computing perspective, the end-user's interpretation of these visualisations is a critical challenge to design for, with empirical evidence already showing that 'usable' visualisations are not necessarily effective from a learning perspective. Since an educator's interpretation of visualised data is essentially the construction of a narrative about student progress, we draw on the growing body of work on Data Storytelling (DS) as the inspiration for a set of enhancements that could be applied to data visualisations to improve their communicative power. We present a pilot study that explores the effectiveness of these DS elements Genre: reflective writing

Reflective Report

Feedback

Resources

Initial thoughts and feelings about a significant experience.

The challenge of new surprising or unfamiliar ideas, problems or learning experiences.

Deeper reflection, personally applied.

How new knowledge can lead to a change

Expressions indicating belief, learning, or knowledge.

Expressions indicating self critique

Words associated with strong feelings

Sentence too long, might disengage the reader. Try breaking it into smaller sentences

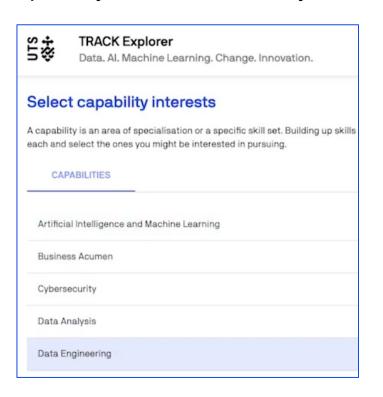
outcomes for the patient. Thus, this experience taught me that in future, I must take a patient-centred approach. Thust spend time addressing the patients concerns and demonstrate excellent communication with them so they can fully understand their clinical picture and history. This relates to Domain 2: Communication and Collaboration, Standard 4: Apply Interpersonal Communication Skills to Address Problems, which is a standard in the National Competency Standards Framework for Pharmacists in Australia (2016). The incident has taught me to use a whole range of communication techniques when counselling a patient. It gave me the opportunity to practice this sort of behaviour in my subsequent weeks of clinical placement. It has strongly encouraged me to shift my perspective to one that focuses more on patient-centred care. I personally think that this is crucial in ensuring that a patient's health objectives are met. This standard I have obtained is important for any practising pharmacist.

based on educators' responses to paper prototypes.

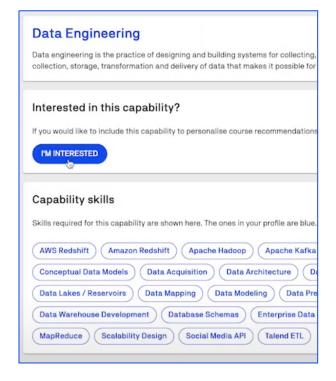
Skills Analytics:

Tailored feedback on learning/career path choices

Upload your CV, and build your skills profile. Then...





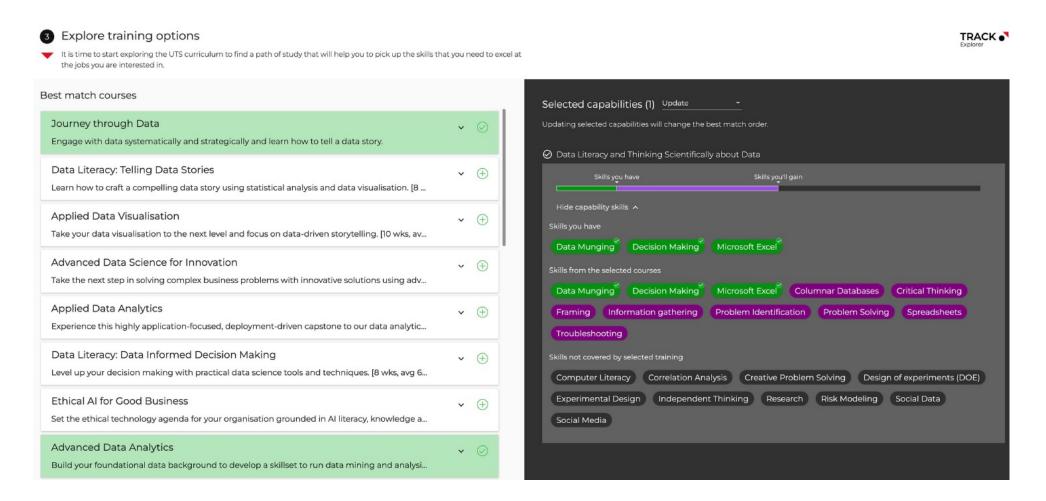




F ://	RACK Explorer Jeata. Al. Machine Learning. Change. Innovation.	
Select U	ITS Open courses	
Start exploring the UTS curriculum to find a path of study that will help you to		
RECOMM	ENDED COURSES	
Data Engineering Foundations		
Ethical Al for Good Business		
Advanced Data Visualisation		
Applied Data Analytics for Cybersecurity		
Data Analy	Data Analytics Foundations	
Advanced Data Science for Innovation		
What Does Facebook Know about You?		

Skills Analytics:

Tailored feedback on learning/career path choices



Buckingham Shum, S., Littlejohn, A., Kitto, K. and Crick, R. (2022). Framing Professional Learning Analytics as Reframing Oneself. *IEEE Transactions on Learning Technologies*, 15, (5), 634-649. https://dx.doi.org/10.1109/tlt.2022.3190055

Boardroom

UTS strategic conversation started in 2011

2011











Envisioning "the Data Intensive University"

DIU UTS-wide Forum

Connected Intelligence Strategy

Privacy & Ethics Forum
Plans for a Masters Degree

Masters Degree Launches

Analytics Pilots in Faculties

Recruit PhDs & Postdocs

First Pilot Evaluation Data

Connected Intelligence Working Party

UTS-wide consultations and interviews

Director Appointed

Launch of the Centre

UTS-wide engagement

Collaboration Proposals

Invited & Projects Initiated

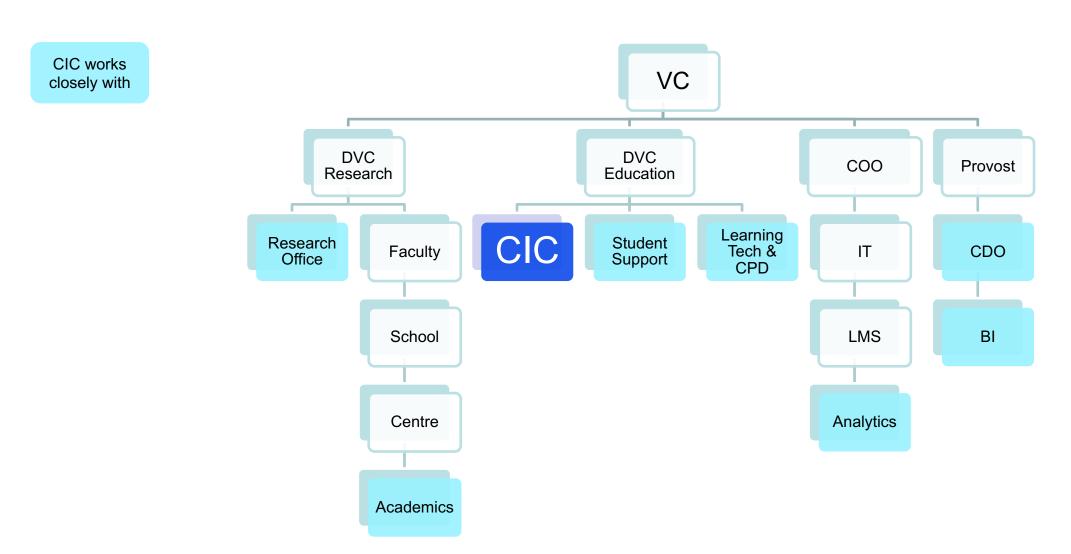
Growing number of Learning Analytics pilots

Initiate internal Data Science consulting

From pilots to mainstream release of LA tools



CIC's organisational positioning: hybrid research + service



"Innovating for sustainable impact"

Architecting Learning Analytics:

Innovating for Sustainable Impact

Simon J. Buckingham Shum and Timothy A. McKay



earning analytics is an academic field that has been taking shape under that banner since around 2010, and it has featured regularly in reports on learning technology futures over the years. It sits at the convergence of learning (learning technology, educational research, learning/assessment sciences), analytics (statistics, visualization, computer/data sciences, artificial intelligence), and human-computer interaction (participatory design, behavioral science, sociotechnical systems design, usability evaluation). In light of the significant investments that some colleges and universities are making in their analytics infrastructures, how can an institution architect itself to innovate at this disciplinary intersection to innovate pedagogically and analytically in order to tackle substantial, strategically important teaching and learning challenges? In short, how can an institution innovate for sustainable impact?

A comparison of the drivers behind the creation of 2 university analytics innovation centres, and the org structures that enable impact:

University of Technology Sydney Connected Intelligence Centre

University of Michigan

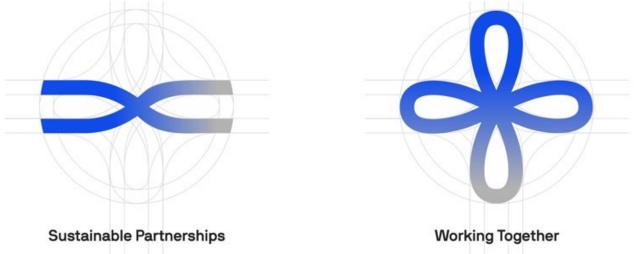
Digital Innovation Greenhouse

EDUCAUSE Review

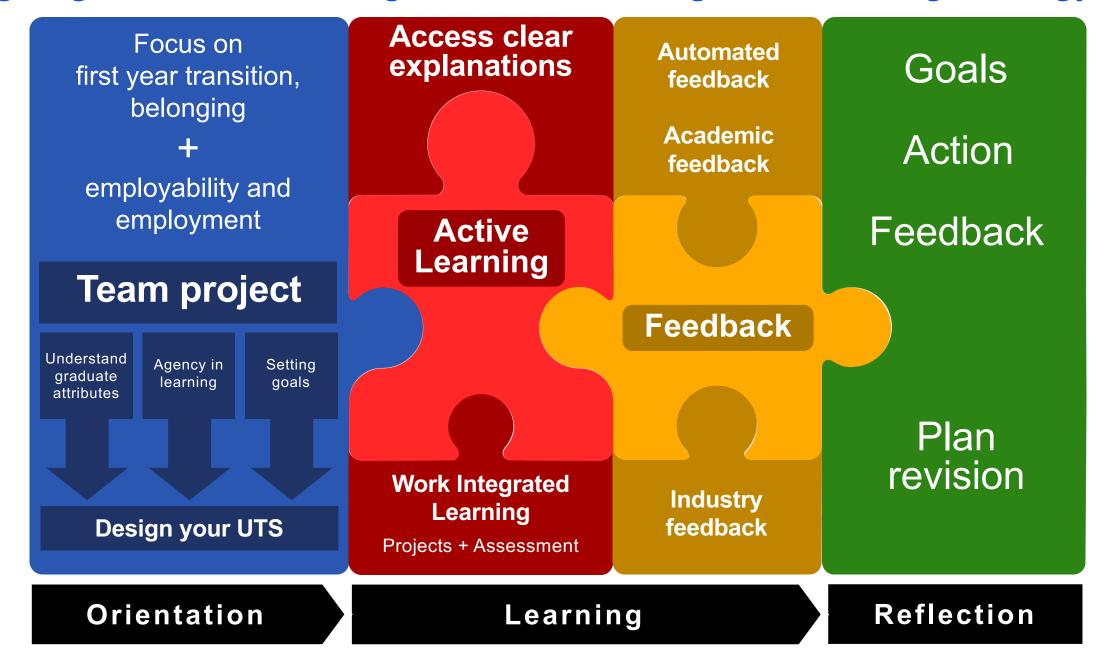
https://er.educause.edu/articles/2018/3/architecting-for-learning-analytics-innovating-for-sustainable-impact

Aligning our LA with UTS 2027 strategy





Aligning LA with "Learning.Futures" learning and teaching strategy



Boardroom briefings: data-informed claims

(From the 2014-17 business case to move from Strategic Pilot to BAU)

ALL faculties

have piloted at least one CIC tool

4918 students

used a CIC analytics tool

133 industry

partners attended CIC events

147_{staff}

attended CIC events

3000 reads

of our AI in Education

Conversation article in first week

150 msecs

to analyse a page of student writing

29 government

partners attended CIC events

30 papers

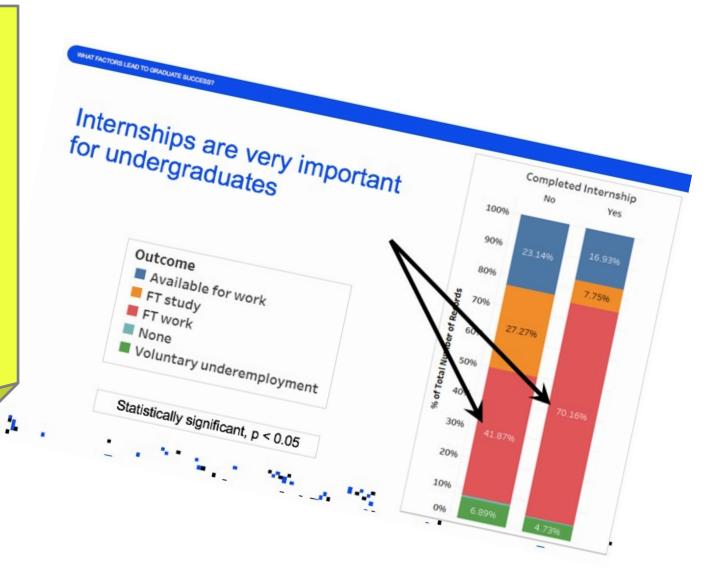
peer reviewed in archival journals and conferences 2015-17

231 staff

trained in/piloted a CIC analytics tool

Boardroom briefings: data-informed claims

"CIC hired a data scientist who works as an internal consultant with UTS teams from any part of the university, providing rapid analyses of their data. This has proven extremely valuable to UTS clients..."

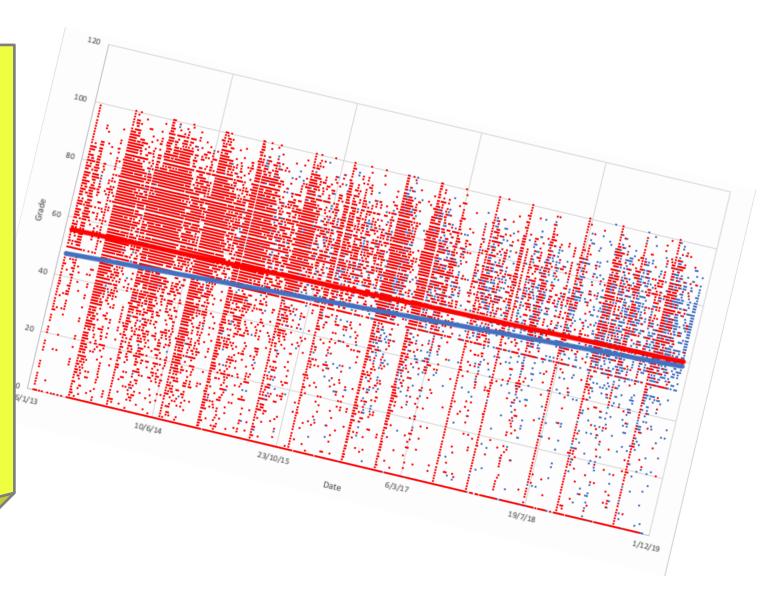


Boardroom briefings: data-informed claims

Student language support team: Are we making a difference to student grades?

"Compared to a control group of students, students who attended a student support service improved their grades significantly, converging on the control group.

From 2013 – 2019 we closed this gap."



Do students who spend a year abroad benefit, compared to

those who stay in Sydney?

"CIC's Data Scientist developed a statistical method to reliably compare students who spent a year overseas with comparable students who did not.

We have been able to use this evidence to speak concretely about our value at Open Days and as part of the retention strategy for the degree.

This was well received at the highest levels of the university and was greatly appreciated by our partner faculties, which were able to use the information specific to their students to amplify our message."



Boardroom briefings: robust LA evidence base

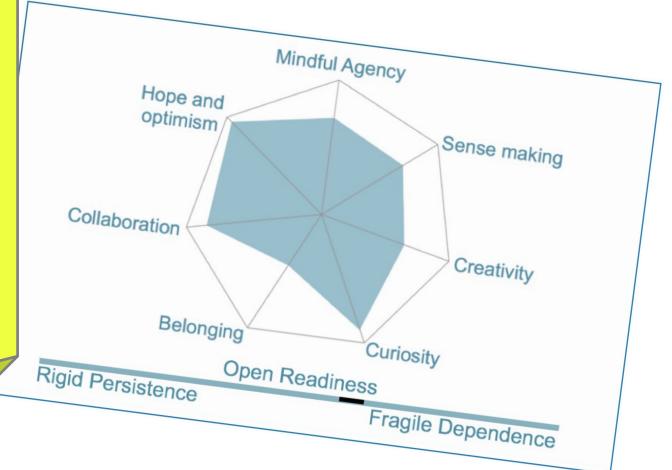
"UTS is the world's first university to provide students with instant formative feedback on reflective writing, with another version focusing on analytical, argumentative writing. Pilot studies with >1800 students provide evidence..."

It is hard to believe that I started placement almost three months ago. It has definitely been full of challenging experiences Which have shaped my understanding of the role of a pharmacist. During my time at Chester Square Pharmacy I was able to observe rotall administration and the clinical aenacts. To be honset my Which have shaped my understanding of the role of a pharmacist. During my time at chester square Pharmacy I was able to observe different sides of pharmacy including pharmacist-patient interactions, retail, administration and the clinical aspects. To be honest my and the idea of having to interact with patients as well as apparing with different sides of pharmacy including pharmacist-patient interactions, retail, administration and the clinical aspects. To be nonest in a pharmacy of the pharmacy of that that my lock of experience would cause an incompanions and I would leave a negative impression. inst thoughts going into piacement were negative, I dreaded the idea or naving to interact with patients as well as engaging with the pharmacy. I felt that my lack of experience would cause an inconvenience and I would leave a negative impression. employees of the pharmacy. I left that my rack of expendic would cause an inconvenience and i would leave a negative impression front of the pharmacist and other employees. However, I came to realise that my preceptor is an exceptional teacher and as the Despite my lack of experience my precentor eneured I cheapled different weeks progressed I begun to look up to him as a mentor. Despite my lack of experience my preceptor ensured I observed different Weeks progressed i begun to rook up to nim as a mentor. The presentation and even encouraged me to engage directly with patients from the early days of placement. By allowing me to the progression of the engage directly with patients from the early days of placement. engage with patients I have been able to build on important communication skills.

My preceptor would also observe my weaknesses and bring them to my attention so that each week we would work on overcoming my weaknesses and turning Important aspects of reflective writing: Initial thoughts and feelings about a significant experience. The challenge of new surprising or unfamiliar ideas, problems or learning experiences. patient. The pharmacist asked me to counsel the patient at his request because I was nervous and embarrassed to Id: Deeper reflection, personally applied. ation as it involved her genitals and so I was unsure of n: Expressions indicating belief, learning, or knowledge. Ltold him how I felt about counselling the patient, however ed: Expressions indicating self critique. in my previous job as a call centre servicing advisor. I ed: Words associated with strong feelings. ecause the customers used Adult websites, which were use it was a sensitive conversation. I dealt with and then I read off a script, which helped ensure that the nique to overcome my fear of discussing sensitive y that was close to the dispensary yet away from other

Boardroom briefings: robust LA evidence base

"Pilots with almost 3000 students and 30 staff provide evidence that when students see their dispositions visualised, this can provoke valuable reflection on the qualities that build their resilient agency..."



Staff room

Walking in the shoes of academics

No trust, no LA deployments!

We are academics and educators ourselves, and know the pressures

We recognise the reputational risk educators are taking with any new EdTech

→ LA+LD support

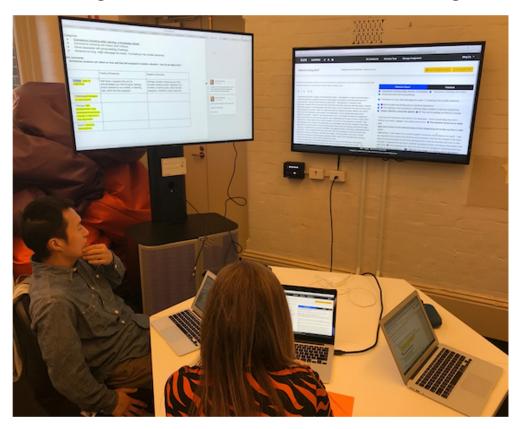
Mutual learning and respect: it goes both ways

Done well, it's exhilarating!



Co-designing writing analytics with academics

Writing the automated feedback messages



http://heta.io/how-can-writing-analytics-researchers-rapidly-codesign-feedback-with-educators https://www.heta.io/co-designing-automated-feedback-on-reflective-writing-with-the-teacher



Google Doc to draft the feedback contingent on patterns:

presence/absence

sequencing

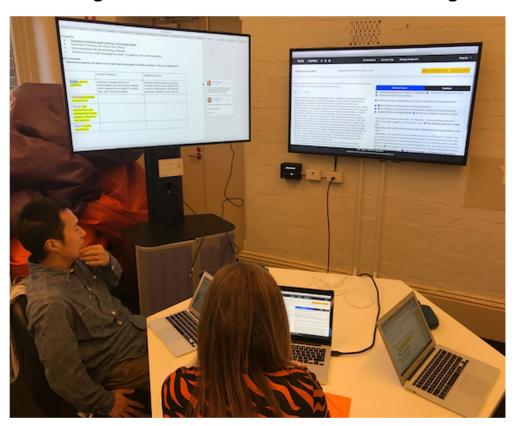
positioning

of sentence types

Highlighting Category	Positive feedback (Presence of highlighting)	Cautionary feedback (Absence of highlighting)
<icon> Context, clear of judgments</icon>	Well done, it appears that you've acknowledged your first thoughts, feelings and/or reactions to an incident, or learning task, within the first paragraph.	Perhaps consider introducing your first thoughts, feelings and/or reactions to an incident, or learning task, within the first paragraph. AcaWriter couldn't spot this.
		(triangle without square) While it appears that you've reported on how you would change/prepare for the future, you don't seem to have described your thoughts, feelings and/or reactions to an incident, or learning task.
<icon> Challenge(strategies to overcome?)</icon>	Well done, it appears that you've reported on something you found challenging. Do you think you could expand the detail related to the challenge?	It appears that you haven't commented on anything you found challenging. If you did find something challenging, please expand on this. (triangle without preceding circle) While it
	(double circles) Well done, it appears that you may have expanded the detail on the challenge you faced.	appears that you've reported on how you would change/prepare for the future, you don't seem to have reported first on what you found challenging. Perhaps you've reflected only on the positive aspects in your report?
<icon> Change new perspectives/ new</icon>	Well done, it appears that you've reflected on how you would change/prepare for the future. Is there anything further to say about these new	It appears that you haven't commented on what you would do differently should the same event occur in the future. Perhaps think about changes

Co-designing writing analytics with academics

Writing the automated feedback messages



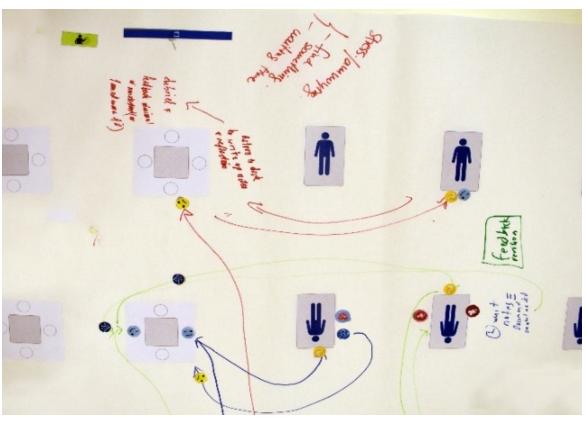
Testing classification thresholds for sentence types



http://heta.io/how-can-writing-analytics-researchers-rapidly-codesign-feedback-with-educators https://www.heta.io/co-designing-automated-feedback-on-reflective-writing-with-the-teacher

Participatory design with educators and students



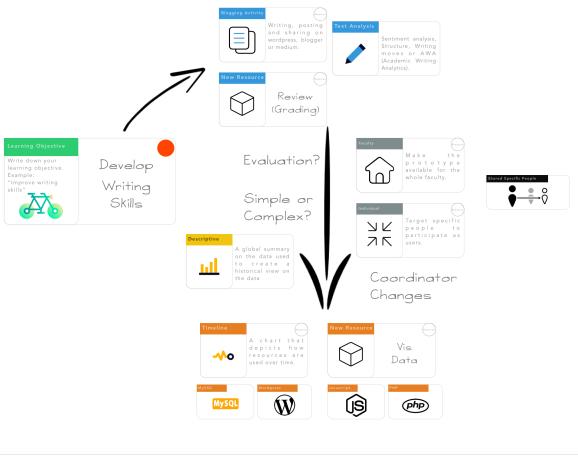


Carlos G. Prieto-Alvarez, Roberto Martinez-Maldonado, & Anderson, T. (2018). Co-designing learning analytics tools with learners. In Jason M. Lodge, Jared Cooney Horvath, & L. Corrin (Eds.), *Learning analytics in the classroom: Translating learning analytics research for teachers* (Vol. 1). London: Routledge.

Participatory design with educators and students

The LA-DECK of cards to give a voice to stakeholders





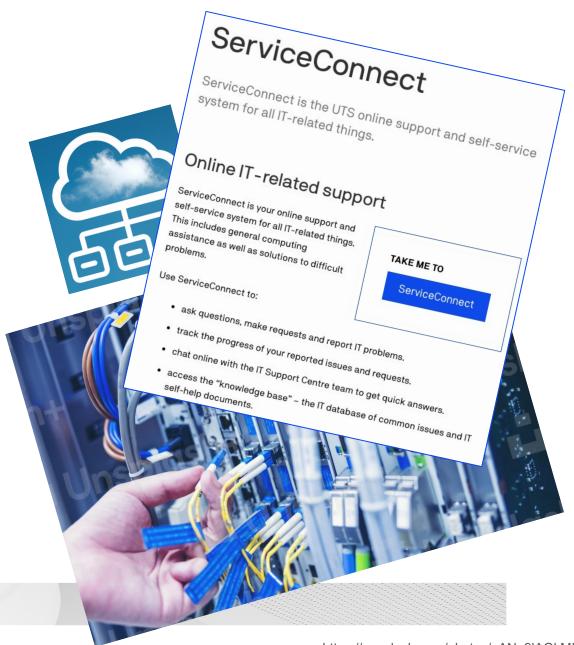
Alvarez, C. P., Martinez-Maldonado, R. and Buckingham Shum, S. (2020). LA-DECK: a card-based learning analytics co-design tool. In *Proceedings of the 10th International Conference on Learning Analytics & Knowledge*. Association for Computing Machinery. https://doi.org/10.1145/3375462.3375476

Server room

From project to 'product'

Steps many LA prototypes never get to...

- secure user authentication ("single sign-on") to provide a seamless and trusted user experience for students and staff
- auditing of the software to ensure compliance with preferred/required languages and architectural design
- security of code and APIs
- cloud hosting in approved infrastructures and location (student data stays in State/Australia)
- cloud scaling strategy to meet variable user demand;
- should a student report a problem there is an IT support workflow to handle the issue.

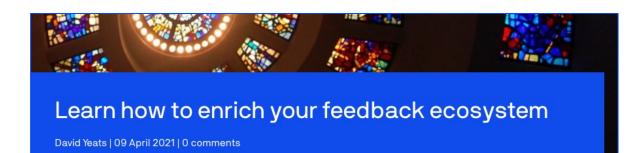




Classroom

(live f-f sessions and online asynch.)

Academic professional development and support



assessment

automated feedback

feedback

learning technology

online assessment tools

'Automated Feedback' has existed in various forms at UTS for quite some time: from online quizzes, to adaptive learning platforms, to conditional messaging. But...

- · But what really is it?
- · Is it really automated?
- · How does it extend upon my existing feedback practices?
- · What can we use it for?
- · Where is it the most effective?

In this event series, we will look at the key categories of automated feedback and how you can use them to respond to a range of common and pressing issues associated with learning and teaching.

The first session provides an introduction to the key types of auto feedback technology. The subsequent three sessions each look at how these can address some key issues around teaching and learning in digital environments.

Learn from experience

Alongside experts from UTS CIC, you will also get to hear from UTS academics about how they have been using some of these tools. We aim to grow a community of interest around this topic to help inform teaching and learning decisions and LX.lab support strategies.

Briefings for teaching teams

https://lx.uts.edu.au/blog/2021/06/11/automated-feedback-looking-back-forward/

1. Enriching your feedback ecosystem with automated feedback

While feedback is often thought of first as the educator's response to a student's assignment submission, the process is suffused through a wide range of different moments throughout a subject experience. Perceiving feedback as an ecosystem shows the potential enriching properties of automated feedback tools.



Enriching your feedback ecosystem with automated feedback (Duration: 60 minutes)

- Public Google slide deck
- · Public Google Jamboard (view only): The Character of Feedback

2. Building student belonging with automated feedback

Automated feedback can be shaped to provide an opportunity to acknowledge and respond to the diverse experiences of individual learners. You can use automated tools to create additional ecosystem touchpoints. Each of these fosters a greater feeling of connection for students. It's also an opportunity to respond to them as individuals and to generate academic literacy, scaffolding, feedback, affirmation and teacher expectations.



Automated Feedback in building student belonging in large classes (Duration: 120 minu

- Public Google slide deck
- Public Google Jamboard (view only): Challenges of Engagement and Belonging

3. Responding to variable student pace of learning

Feeding into the process using these auto tools leads to an awareness that can be responded to either automatically manually or through designed change. An automated feedback system is collecting information about a student's situation. Ultimately the more meaningful information we can learn from students, the more we can help them succeed by responding to their pace and preferences.



How can AF tools flex to student needs to create the best experience for them? (Duration; 90 minutes)

- Public Google slide deck
- Public Google Jamboard (view only): Challenges of responding to variable student pace

4. Diagnosing your students' needs with automated feedback

Hawing the opportunity to see whether feedback was received as relevant provides the opportunity to configure practice when it would not otherwise be available. In traditional "feedback loop" suggests that this is do not by seein the work produced by students. However, garnering responses using other more direct tools gives a space where les interpretation is needed. Students can tell you directly what they feel they need and you can make data-driven decisions.



Automated Feedback and diagnosing your students' needs (Duration: 90 minutes)

- Public Google slide deck
- Public Google Jamboard (view only): Challenges of diagnosing & getting visibility of your students' needs

Academics motivating writing analytics to their students

Civil Law essay writing



Philippa Ryan, Law academic

"[rhetorical moves] indicate to the reader the writer's attitude to the text. Why do we worry about that? Because as lawyers, our job is to [...] argue that the way that we see the facts and the law favours a certain position or outcome."

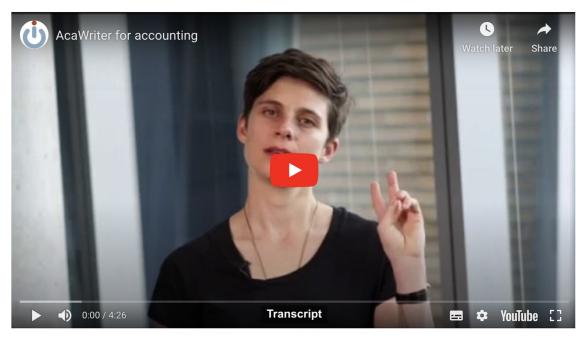
Academics explaining to their students why they need to care about their writing, and the relevance of AcaWriter

Civil Law essay writing



Philippa Ryan, Law academic

Accounting report writing



Nicole Sutton, Accounting academic



In class support

- Orientation portals and guides for students and staff
- Live or recorded video briefings
- Canvas modules to insert into course resources
- Cloud services ready (e.g. 400 simul. users in a class session)
- Learning design patterns for the effective use of the LA tool





Classroom

(impact analysis)

What we know about the impact of OnTask on students

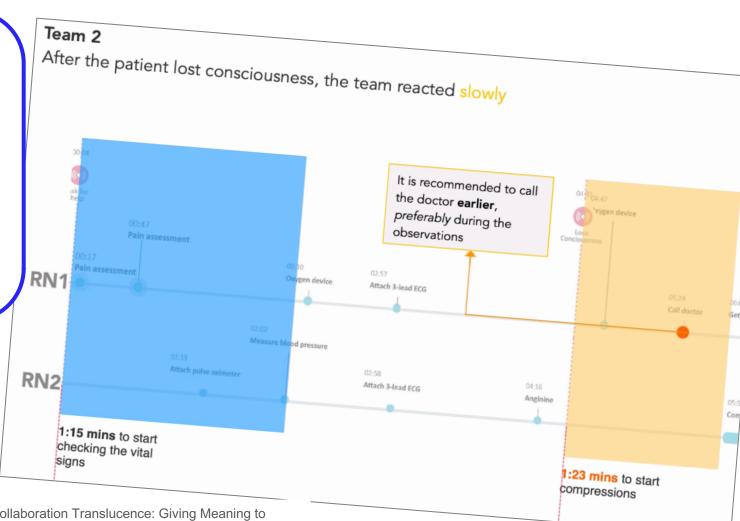
- Fostered more optimal study habits 1, 5
- Enhanced academic performance ^{1, 6}
- Elicited a 'safe anxiety' in some students ²
- Spurred student motivation ^{2, 3}
- Fostered greater feelings of support ^{2, 4, 7}
- Supported all phases of self-regulated learning ³
- Enhanced students' course experience ^{4, 6}



Student reaction to automated feedback on teamwork

"This tool helped me have quantitative data to reflect on.

I can actively look back and see my exact actions, not just other perceptions of it"



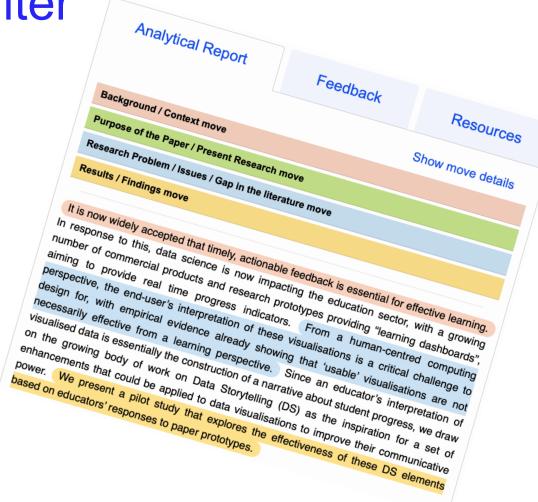
Echeverria, V., Martinez-Maldonado, R. and Buckingham Shum, S. (2019). Towards Collaboration Translucence: Giving Meaning to Multimodal Group Data. In *Proceedings of ACM Conference on Human Factors in Computing (CHI'19)*. ACM: NY. Paper 39, pp. 1-16. https://doi.org/10.1145/3290605.3300269

Nursing educator reaction to automated feedback on student teamwork

"I think it would be really helpful for students ... if you gave them really structured reflection questions ... and asked them to reflect on what they were doing — whether it was accurate or not, how they're engaging with the patient and other team members, what they were thinking and feeling at the time — it would be a really valuable tool for deep reflection."

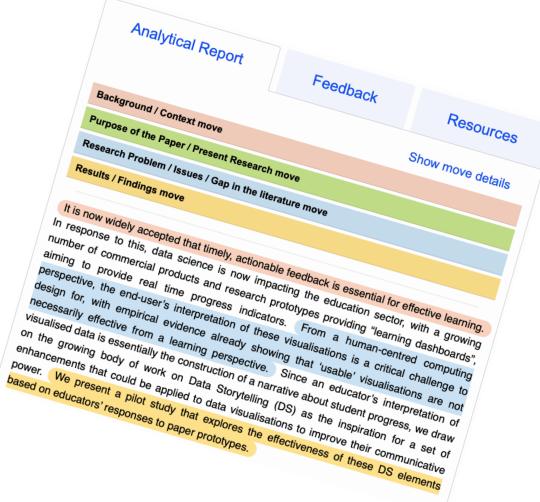
What does success look like?
Students feedback on AcaWriter

"I think what is being taught is something I was already aware of. However, by being forced to actually identify ways of arguing, along with the types of words used to do so, it has broadened my perspective. I think I will be more aware of the way I am writing now."



What does success look like?
Academics feedback on AcaWriter

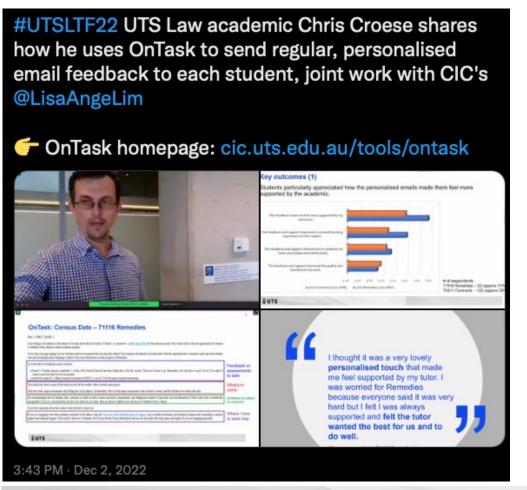
"We can't afford to give formative feedback when we have 400 students because it already takes us maybe about 20 hours to mark one class of these assignments — and so we can't have the tutors spend that time again giving formative feedback. So, we had to do it in a way that is time-efficient."

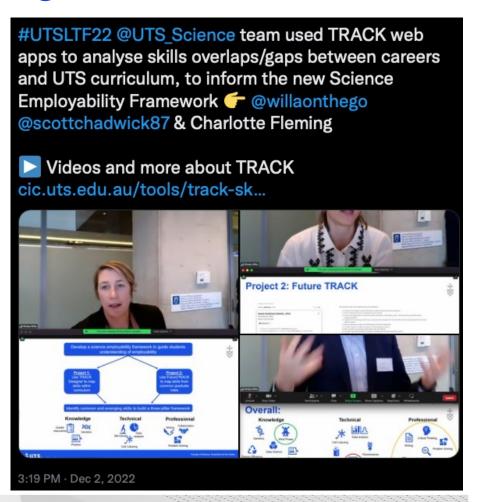


What does success look like? Educators' feedback on AcaWriter

"Overall, since we've been working with CIC around written communication over the course of the last four of five semesters, we have seen marked improvement in students' written communication. Overall their individual assignment pass-rate is going up... We are seeing improvements in the number of students who are either meeting or exceeding the expectations around written communication"

The joy of seeing academics reporting their use of our tools ©

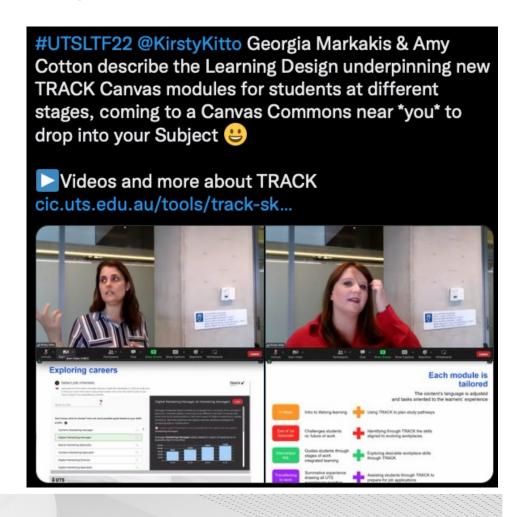






The joy of seeing academics reporting their use of our tools ©

#UTSLTF22 Accounting for feedback- Accounting academics @AmandasAudit and Rina Dhillon share about how they used @ontasklearning for personalising study advice, with some evidence to show impact on students engagement ED STUDY ADVICE Business and Society 4:40 PM · Dec 2, 2022





Ethics

As LA scales up, how do we build and sustain trust in the UTS community?

→ a structured, participatory, rewarding consultation process

The "EdTechEthics" Consultation

5 online Deliberative Democracy workshops, 3-4 hrs, with UTS students, tutors and academics

Sept. 2021

Oct - Nov -

Dec — 2022...

Recruit a "Deliberative Mini-Public"

20 students and staff

from 'expert witnesses' and to reflective deliberation

Interactive workshops

Numerous hands-on activities to help engage with LA/AIED ethical dilemmas

Identify, discuss and prioritise principles and develop UTS examples

Present principles to UTS leadership

Open dialogue with Data/Analytics
Governance

→ 2022: inform and align with UTS AI Policy

A UTS Deliberative Democracy Consultation (Oct. - Dec. 2021)

The closing presentation from the EdTechEthics consultation

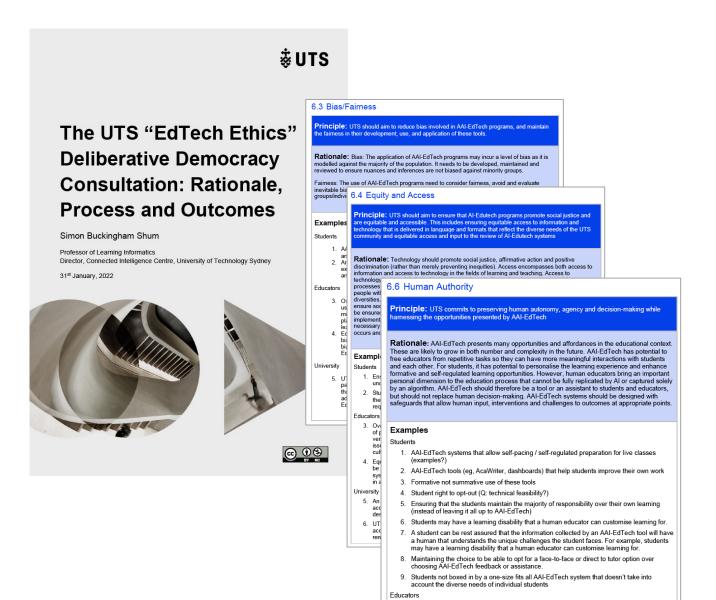




Elsa Baker: Undergraduate, UTS Design, Architecture & Building

EdTechEthics principles & examples

How this could play out for UTS students, educators and the institution





UTS Al Operations Policy 2022

"LA culture" comes from trust

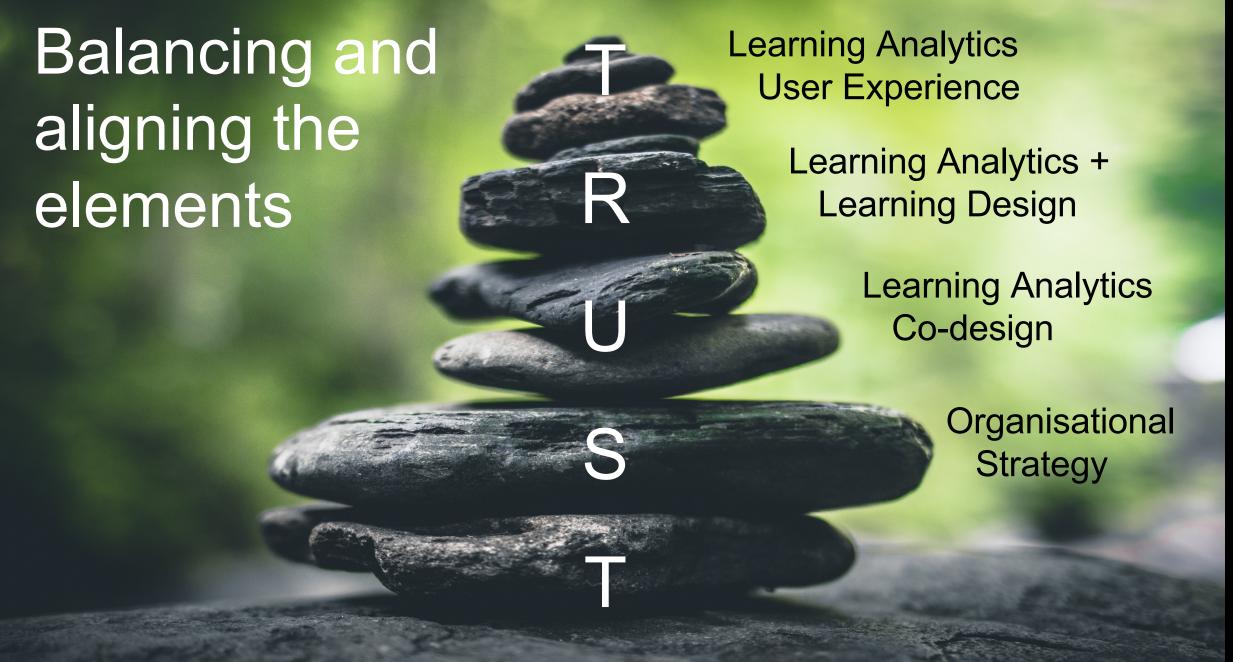
Trust comes from respectful conversations in 4 different 'rooms'...

Boardroom

Staff room

Classroom

Server room



The chapter behind this talk...

https://simon.buckinghamshum.net/2022/07/embedding-learning-analytics-in-a-university/

Buckingham Shum, S. (In Press). Embedding Learning Analytics in a University: Boardroom, Staff Room, Server Room, Classroom. In Viberg, O. and Grönlund, Å. (Eds.), *Practicable Learning Analytics,* Springer Nature.

Abstract: In this chapter, I describe and reflect on the last 8 years at an Australian public university, inventing, piloting and evaluating Learning Analytics tools, specifically focused on data-driven personalised feedback, leading in some cases to integration with the institution's learning technology ecosystem, and accompanied by staff training and support. I will summarise this as conversations in the *Boardroom*, the *Staff Room*, the *Server Room* and the *Classroom*, reflecting the different levels of influence, partnership and adaptation required to introduce and sustain novel technologies in the complex system that constitutes a university, or indeed, any educational institution. This chapter is pragmatic, documenting aspects of our work that are typically not the focus in research papers, intending to make a practice contribution.

Keywords: Organisational Strategy, Innovation Diffusion, Personalised Feedback